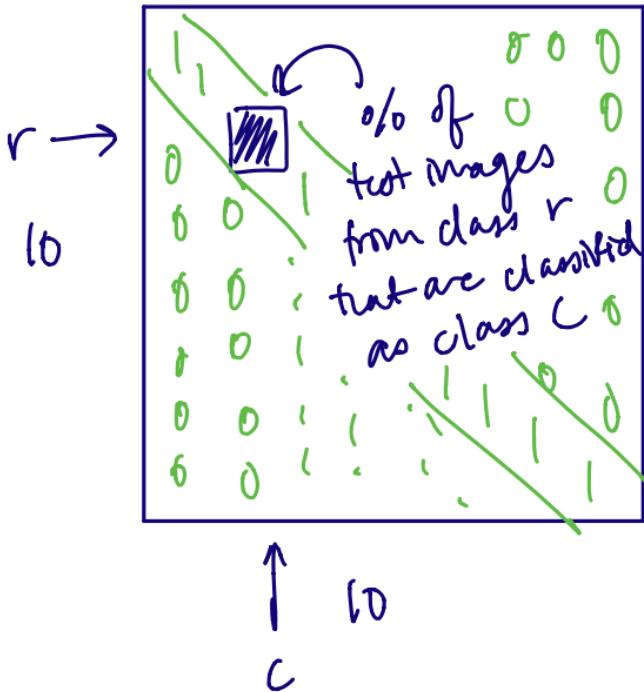


## Confusion Matrix



0	1	2	3	4	5	6	7	8	9
0	...	...	...	...	...	...	...	...	...
1	...	...	...	...	...	...	...	...	...
2	...	...	...	...	...	...	...	...	...
3	...	...	...	...	...	...	...	...	...
4	...	...	...	...	...	...	...	...	...
5	...	...	...	...	...	...	...	...	...
6	...	...	...	...	...	...	...	...	...
7	...	...	...	...	...	...	...	...	...
8	...	...	...	...	...	...	...	...	...
9	...	...	...	...	...	...	...	...	...

how many test images from class 1 were defined as class 9?

Confusion Matrix [1][9] =  $\frac{\# \text{ of class 1 images defined as 9}}{\# \text{ of data 1 images}}$

- > find indexes of "i" class images in testLabels (indexes of Labels)
- > go through each index, if value of results at that index == "j", increment counter (value counter)
- > populate confusionMatrix [i][j] with  $\left( \frac{\text{value Counter}}{\text{indexes of Labels.size()}} \right) 100$ .

# Naive Bayes Outline

## Tasks

- Read training data from files and generate a model
- Save a model as a file
- Load a model from a file
- Classify images from a file

} Training Stage

} Classifying Stage

## (C) ReadData class

- parse data file

## (D) Model class

- find  $P(F_{00} = 0 | \text{class} = "1")$ ,  $P(F_{00} = 1 | \text{class} = "1")$   
 $P(F_{01} = 0 | \text{class} = "1")$ ,  $P(F_{01} = 1 | \text{class} = "1")$   
 $P(F_{02} = 0 | \text{class} = "1")$ ,  $P(F_{02} = 1 | \text{class} = "1")$   
 $\vdots$   
 $P(F_{2828} = 0 | \text{class} = "1")$ ,  $P(F_{2828} = 1 | \text{class} = "1")$

(generate array model of  
probabilities for class 1)

model possibilities

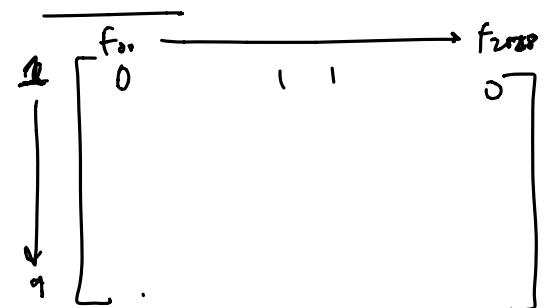
> 2D Vector  $(2 \times 784) (9 \times 784)$

> 3D Vector  $(28 \times 28 \times 2)$   
 $(28 \times 28 \times 9)$

name  
of  
class variable  
prior vector  
probability vector

0	1	
0.542	0.458	$P_{00}$
...	...	
~	~	
~	~	
.	.	
.	.	
~	~	$P_{2828}$

Model (1)



> priors :  $P(\text{class} = c) = \frac{\# \text{ of training examples where } \text{class} = c}{\# \text{ of training examples}}$

$P(\text{class} = 1) = \frac{\# \text{ of training examples where } \text{class} = 1}{\# \text{ of training examples}}$

prior vector =  $[0.~, ~, ~, ~, ~, ~, ~, ~, ~]$  all prior probabilities

Save model as  
model instance

⑥ Read Model Class → 2D vector

- Class 1 probability =

- $$\bullet P(f_{1,1} \mid \text{class 1}) = \sim$$

posterior probabilities vector  $\left[ \begin{array}{c} \tilde{a}_1 \\ \vdots \\ \tilde{a}_n \end{array} \right]$

- highest values is the correct class!

Steps : training

> start with "ZERO"

→ Using "trainiglabels", find indexes of all zero images

> using "training images", start with first pixel in each image @' indexes

- if pixel = '#' or '+', increment counter.
  - length of indexes\_of\_images is total # of examples where class = ONE.

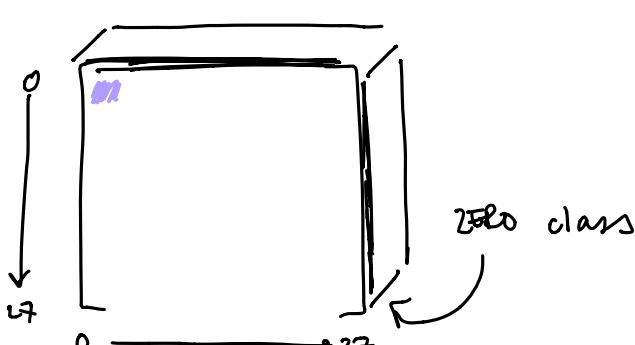
$$= P(F_{i,j} = f | \text{class} = c) = \frac{k + \text{# of times } F_{i,j} = f \text{ when class} = c}{2k + \text{Total number of training examples where class} = c}$$

arbitrary  
 ↑  
 on counter

indexes\_of\_images.length

> populate model Array with probability found :

model Array [250] [0] [0] = ~~0~~



- > repeat process for all pixels
- > repeat process for all digits

This will result in a model with all pixels/levels filled.

- \* write this model to a file to save it.



## Steps : classifying

- \* what you have : file of images, textfile with model

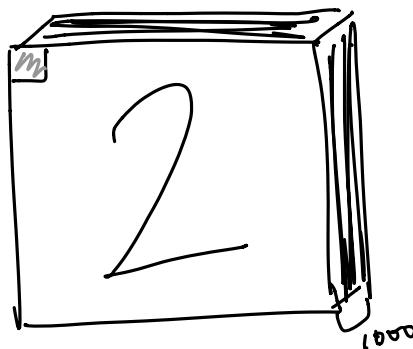
> read model.txt and populate probabilityVector

> read "testImages.txt" and populate testImagesVector

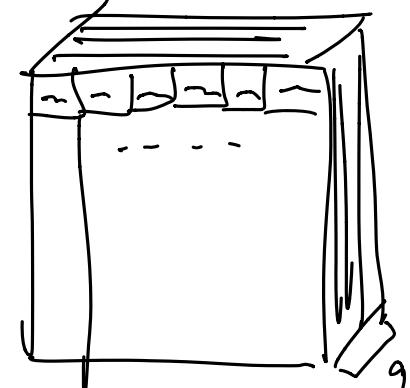
> posterior Probability Vector is float with 10 spots

$$> \text{PPV}[\text{digit}] = \underbrace{\text{priorVector}[\text{digit}]}_{1} + \underbrace{\text{probability}[\text{digit}][0][0] + \dots + \text{probability}[\text{digit}][28][28]}_{1}$$

posterior probability:  $\log(P(\text{class})) + \log(P(f_{1,1}|\text{class})) + \log(P(f_{1,2}|\text{class})) + \dots + \log(P(f_{28,28}|\text{class}))$



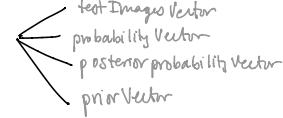
if ( $m = \# \text{ or } +$ )  $\rightarrow$  probabilityVector[digit][m]  
else  $\rightarrow$  1 - probabilityVector[digit][m]



- > start @ first pixel

- > check if m/off

- if ( $m = \# \text{ or } +$ )  $\rightarrow$  probabilityVector[digit][m]  
else  $\rightarrow$  1 - probabilityVector[digit][m]

④ Detector Class 

- > start with first image in testImages

## Trainer Class

- training\_images [][][]
- training\_labels []
- priors []
- model [][][]
- numberOfTimesDigitOccurs []

> getters for all variables (not # of times)

> set Training Images (file)

↳ put stuff from file into training\_images

> set Training Labels (file)

↳ put stuff from file into trainingLabels

> set # of times digit occurs (trainingLabels [])

↳ populate numberOfTimesDigitOccurs []

> set priors (# of times Vector)

↳ populate priors

> set Model (trainingLabels, trainingImages)

↳ populate model

initialize Trainer

## Detector Class

- test\_images [][][]
- test\_labels []
- posteriors [][]
- results [] → size = 1000
- confusion\_matrix []
- model [][][] } pass into constructor
- priors []

> getters for all variables

> set Test Images (file)

↳ put stuff from file into test\_images

> set Test Labels (file)

↳ put stuff from file into test\_labels

> set Posteriors (testImages)

↳ populate posteriors for every page

> set Results (posteriors)

↳ calculate max of array row of posteriors, populate results array

> set Confusion Matrix (testlabels, results)

↳ compare and populate

generateResults